

**NASA Science Mission Directorate  
Earth Science Division  
Applied Sciences Program**



**Analysis of Agricultural Water Supply-Demand Imbalance  
During the California Drought**

*Noah Molotch*

**NASA Water Resources Team Meeting**

**June 27-28, 2018**



# Analysis of Agricultural Water Supply-Demand Imbalance During the California Drought

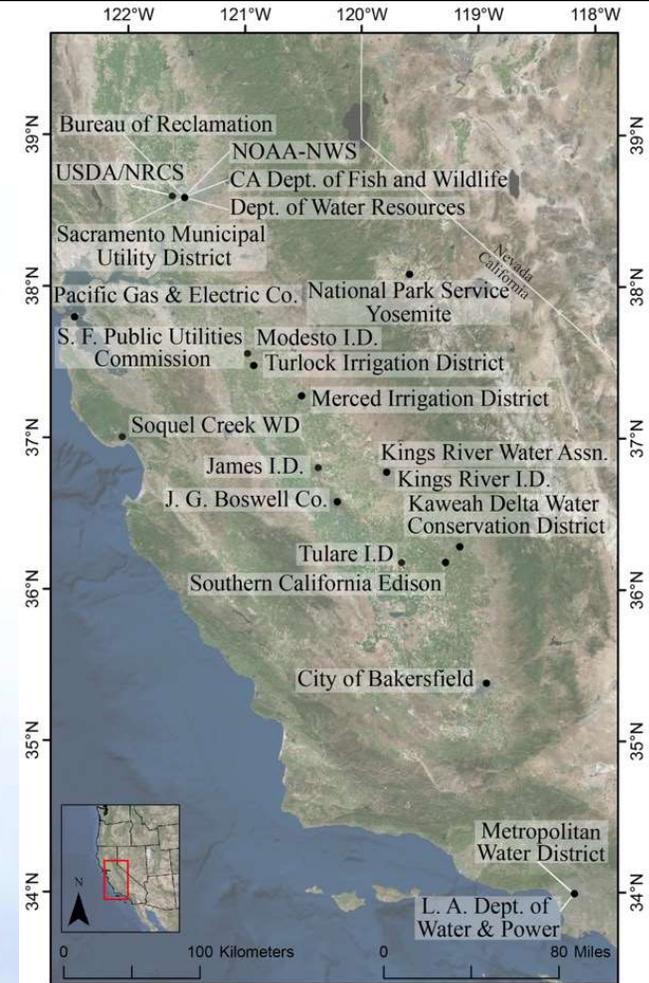


## Current partners and user community

- Partner: California Dept of Water Resources
- Center for Water, Earth Science & Technology
- JPL
- User community: Federal, state and local entities across California; e.g. irrigation districts and municipalities.



University of Colorado  
Boulder



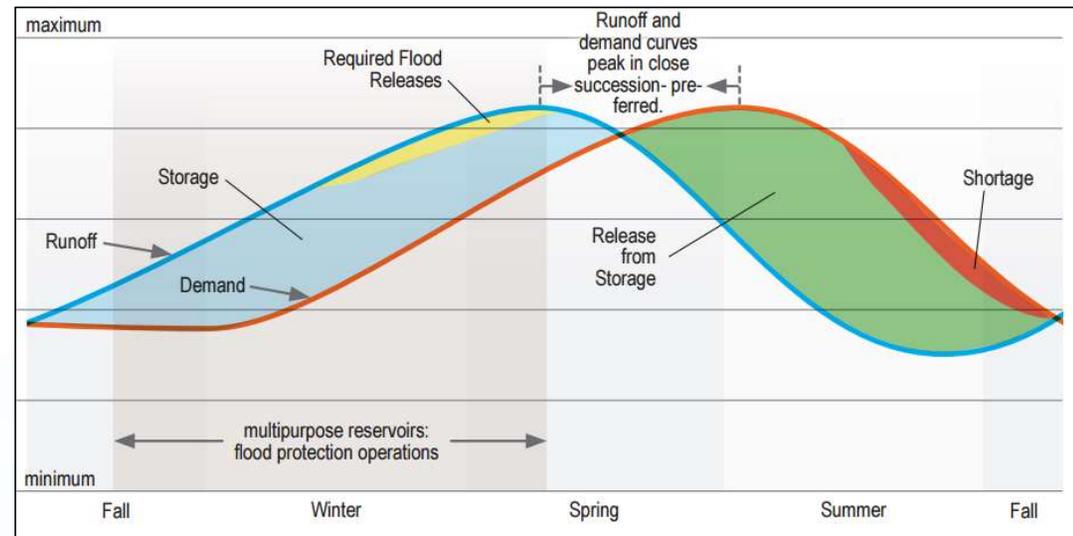
# Analysis of Agricultural Water Supply-Demand Imbalance During the California Drought



- Evaluate agricultural water supply-demand imbalances.
- How can remotely sensed snow information improve water supply forecasts?
- Assess utility of satellite-based snowpack information with regard to meeting user needs.



## Water supply and demand



Source: CA DWR

***"A snow pillow is 8' x 5', and I've got 1,500 square miles of watershed..."  
(Anonymous User)***

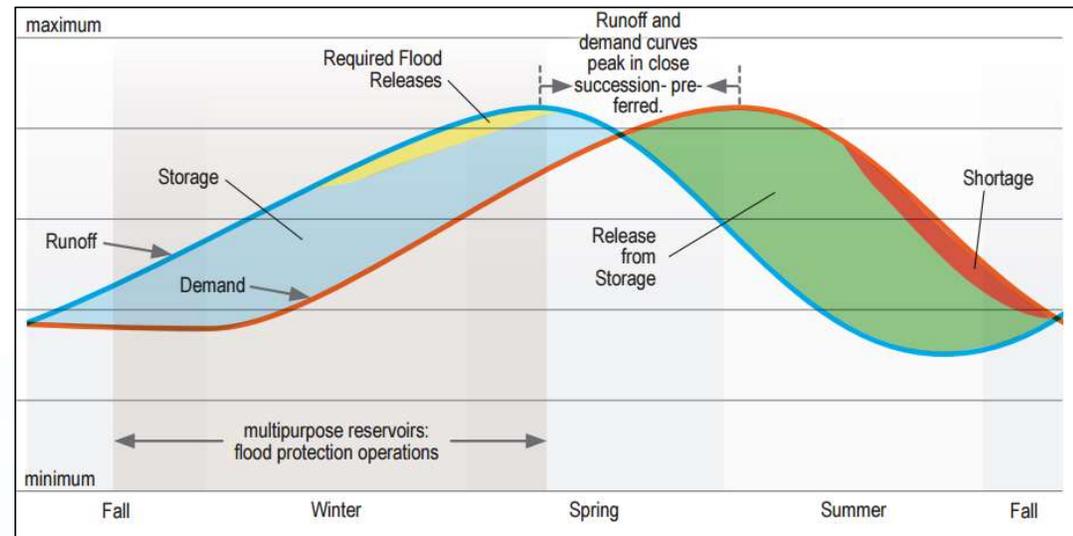
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## Water supply and demand



Source: CA DWR

***“If you can eliminate or reduce one of the major two uncertainties in runoff forecasting—how much snow is actually up there—that’s huge”  
(Anonymous User)***

# Regression SWE Modeling Inputs



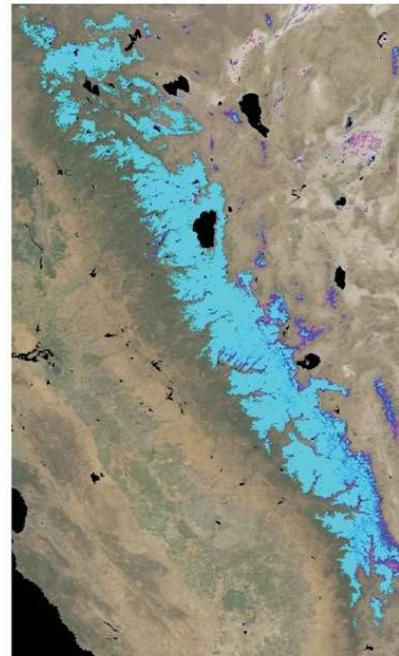
## Snow Pillows



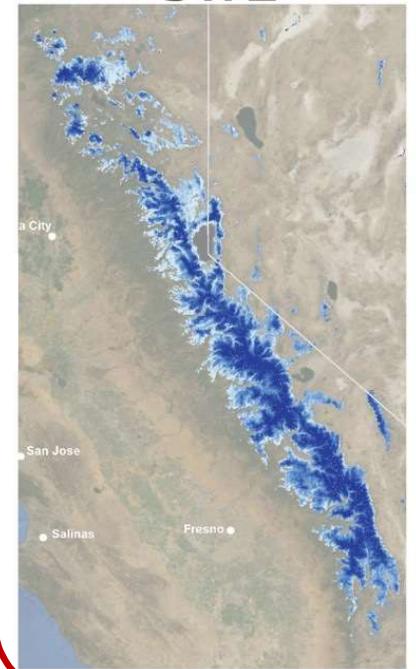
## Independent Variables

- Latitude
- Elevation
- Local Slope
- Local Aspect
- West footprint slope
- Regional Slope
- Regional Aspect
- W/NW/SW distance to ocean
- W/NW/SW barrier height
- Reconstruction

## MODSCAG Snow-covered Area



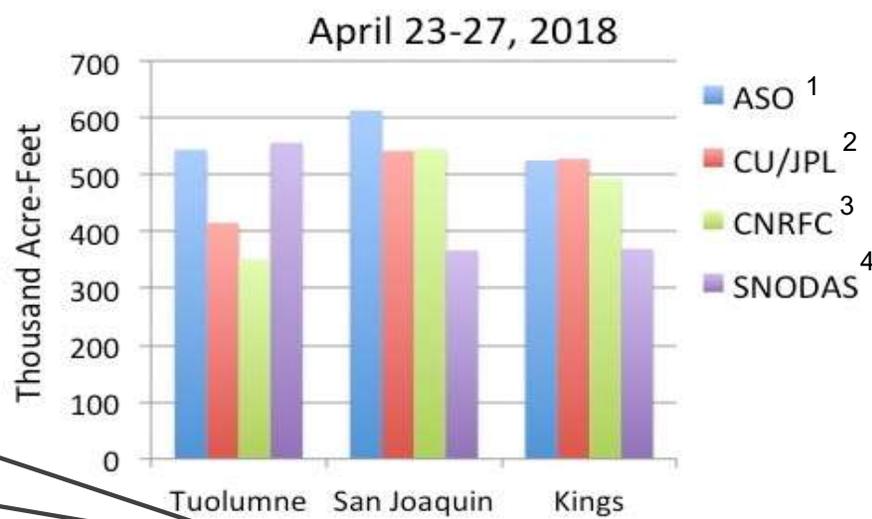
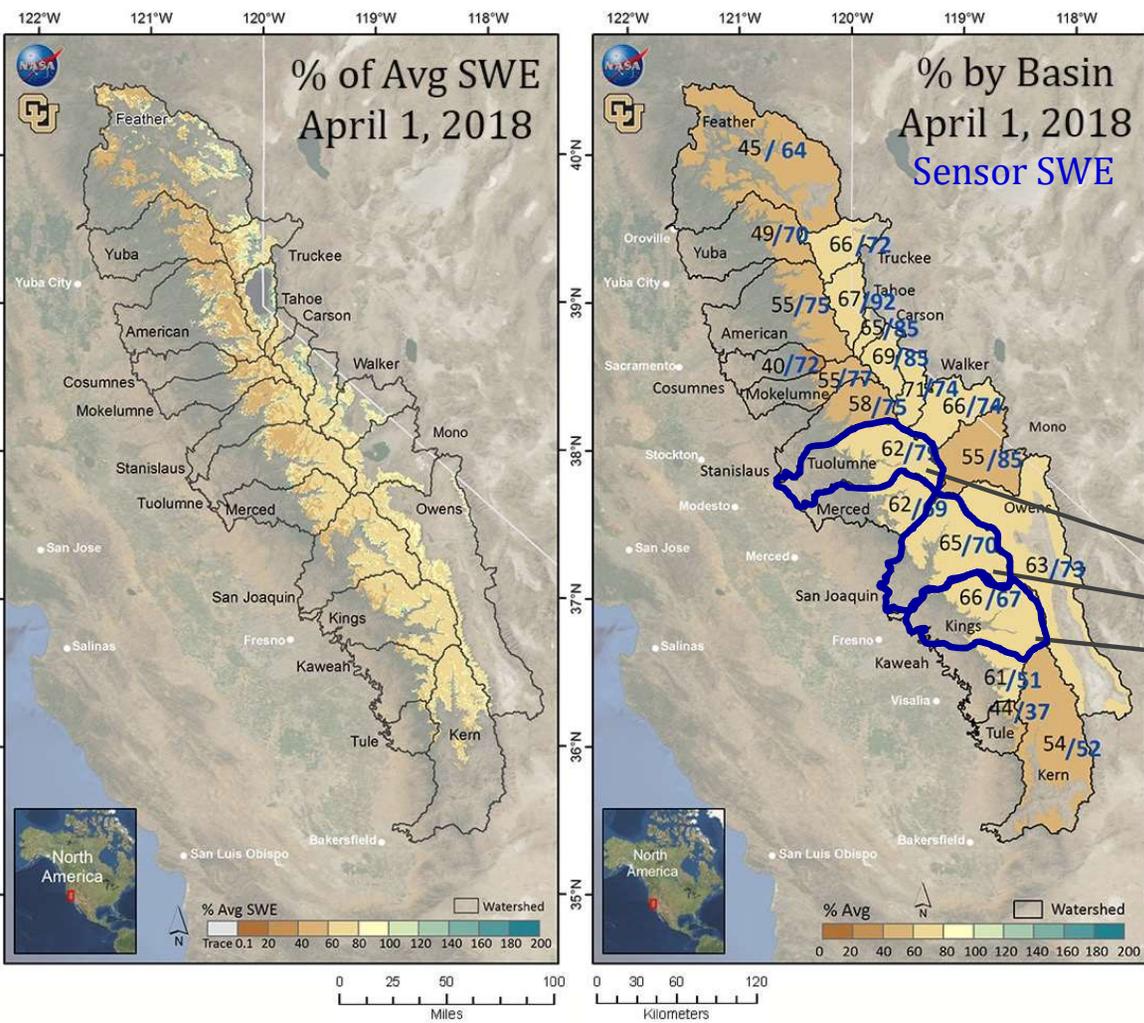
## Regression SWE



0 25 38 47 >85

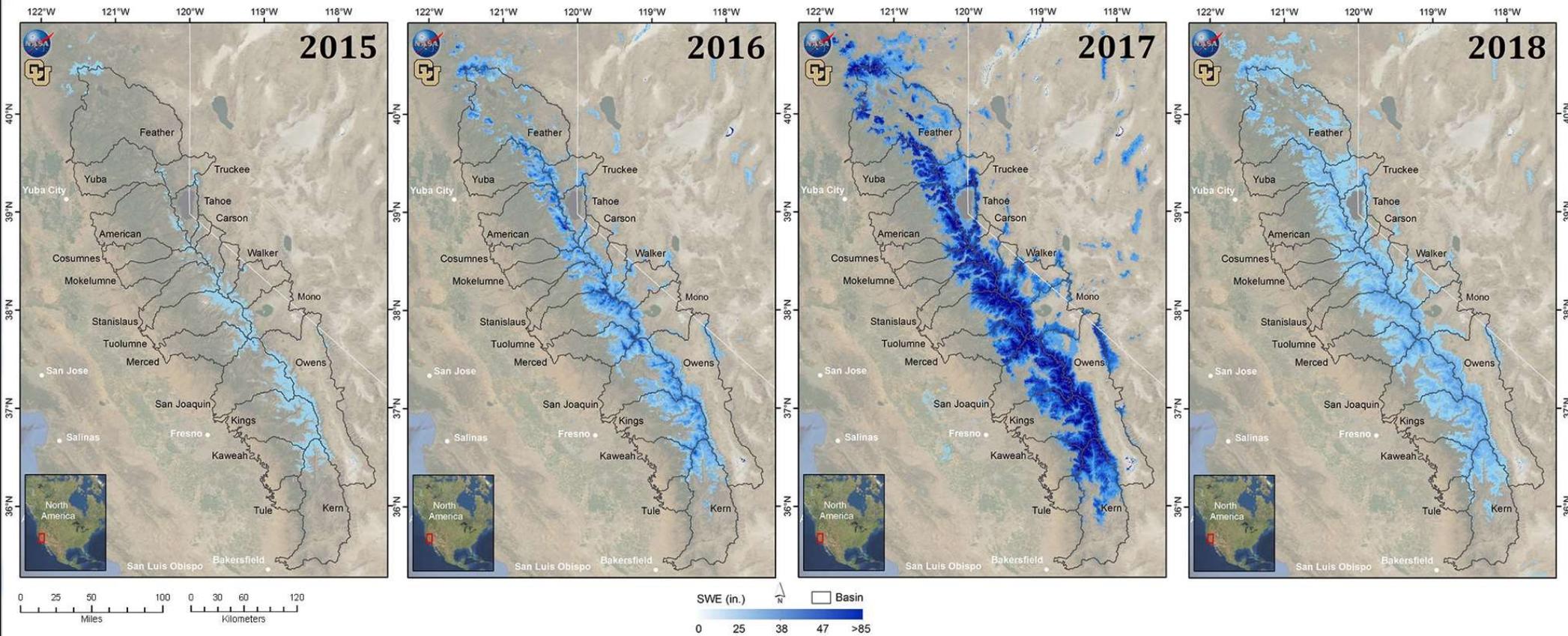
SWE, inches

# Can remotely sensed snow information improve water supply forecasts?

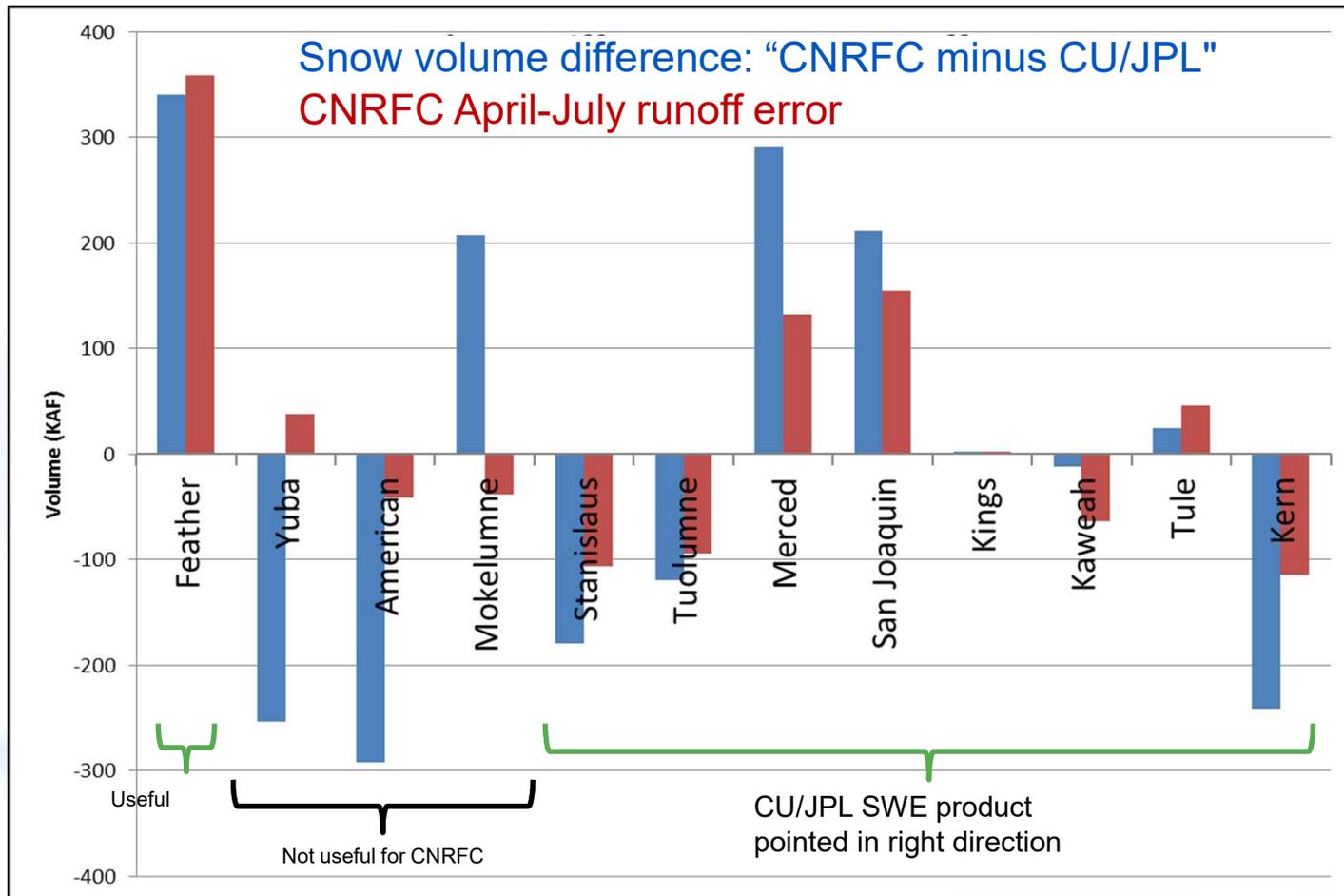


- 1 Airborne Snow Observatory
- 2 CU/JPL Regression SWE Product
- 3 California Nevada River Forecast Center
- 4 NOAA NOHRSC National SWE Product

# Recent inter-annual variability of April 1<sup>st</sup> SWE



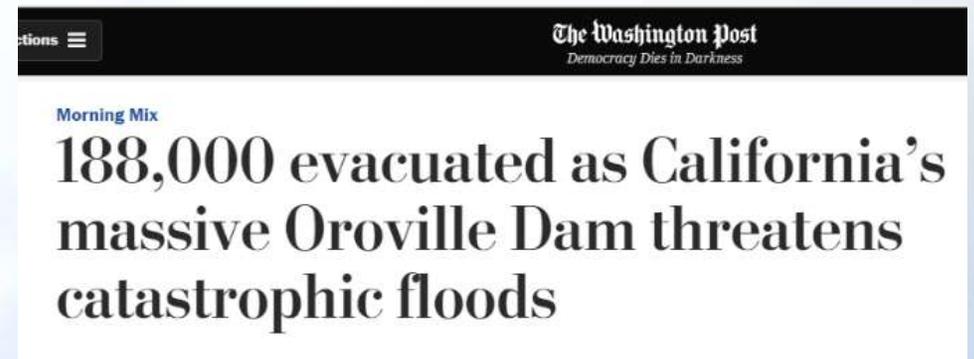
# In Nine out of 12 basins, the CU/JPL SWE product would have reduced runoff error for the California Nevada River Forecast Center (CNRFC)





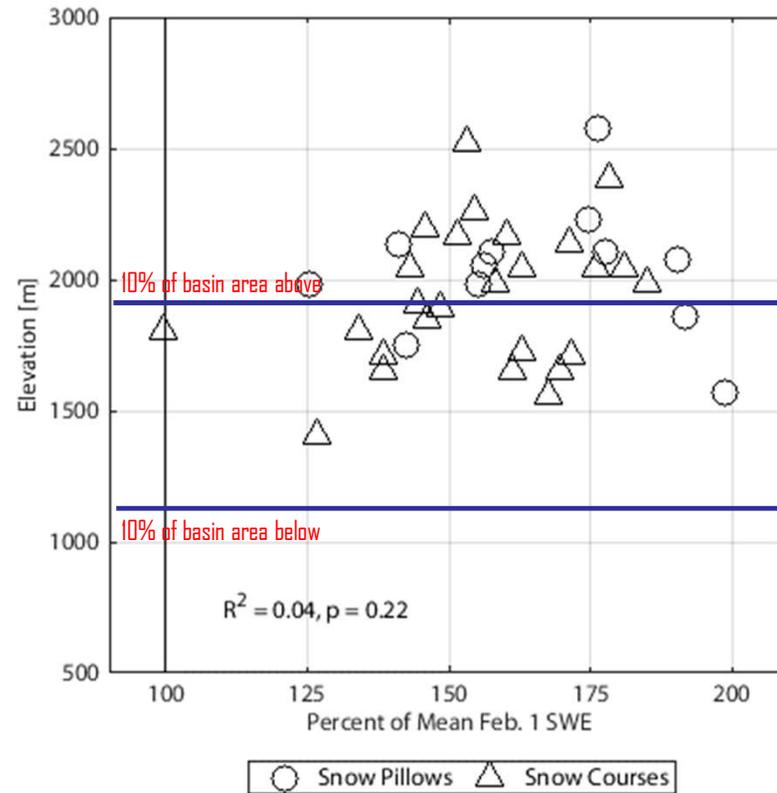
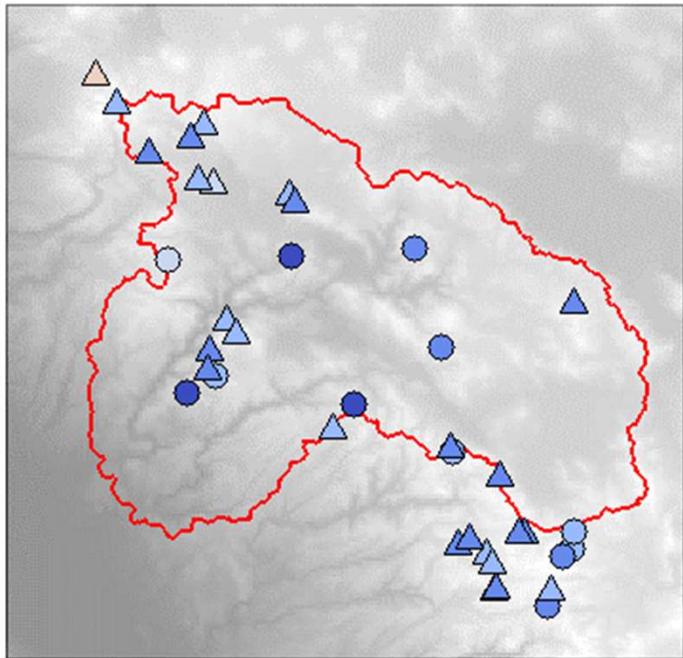
## February 2017 Oroville Dam crisis

- Extreme inflows to Lake Oroville observed February 7-11, peaking at 192,000 cfs late on February 9
- Highest observed rate since January 1997 flood of record
- 1.3 MAF 5-day inflow total
- What drove such a remarkable streamflow event?



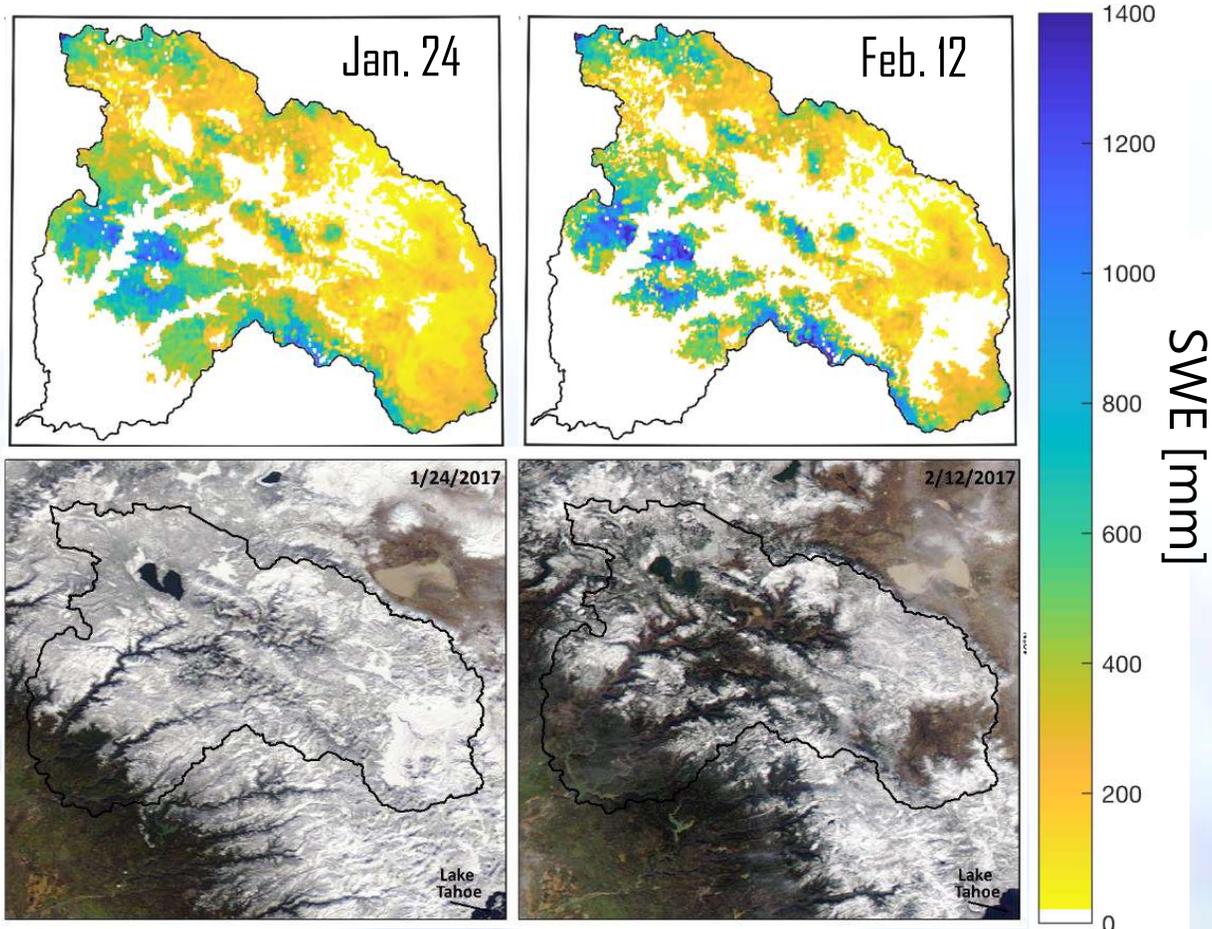
Henn, Musselman, Ralph, Lestak, and Molotch (*in prep*)

## Antecedent Snowpack



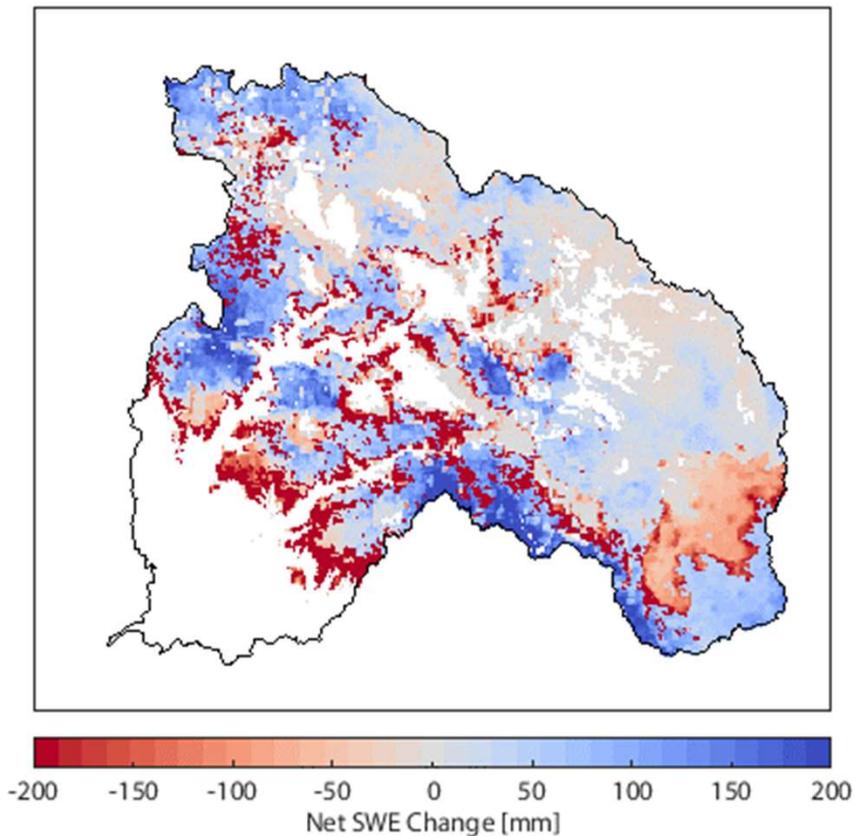
- Antecedent snowpack far above February 1 long-term average (160% of normal) after very active AR sequence in January
- SWE above average at all elevations with pillows/courses

# SWE maps before and after the flood event show significant snowmelt



- CU / JPL gridded SWE estimates before & after the flood event
- SWE maps available for MODIS clear-sky images on January 24 and February 12, 2017

## Basin-wide snowpack losses contributed 11% to the flood wave: CU/JPL SWE Product



- 26 mm SWE loss averaged over Feather River Basin between Jan. 24 and Feb. 12
- 230 mm measured precipitation over basin
- total water available for streamflow generation was 11% higher due to snowmelt

Henn, Musselman, Ralph, Lestak, and Molotch (*in prep*)



## CONCLUSIONS

Spatial SWE products offer potential to improve:

- Water supply forecasting: in 9 of 12 watersheds NOAA NWS CNRFC forecasts would have improved with the spatial SWE information
- Flood risk assessment: real time SWE mapping illustrates that 11% of the Oroville-event flood wave was associated with snowmelt / rain-on-snow
- Drought impact assessment: SWE products show a snow-water deficit of 54 Million Acre Feet going into the 2018 water year



And some optimism....

*“Every drought, we changed our water management—our water management became more sophisticated... And this most recent drought was no different” (Anonymous User).*

# How do available SWE products compare to ASO SWE?



## How do available SWE products compare to ASO SWE?



### 1) ASO SWE (Painter et al., 2016)

- a) LiDAR – snow depth; iSnobal – snow density
- b) weekly in snow ablation season, 50m, limited basins, high accuracy,

### 2) Guan's SWE Reconstruction model (Guan et al., 2013)

- a) land surface model / snow depletion curve / MODSCAG + blended with observed SWE
- b) daily from 3/1 to 8/31 (2000-2014), 500m, entire Sierra, relatively high accuracy

### 3) Margulis's SWE reconstruction model (Margulis et al., 2016)

- a) A Particle batch smoother – land surface model / snow depletion curve / Landsat fsca
- b) daily (1985-2016), ~90m, entire Sierra, relatively high accuracy

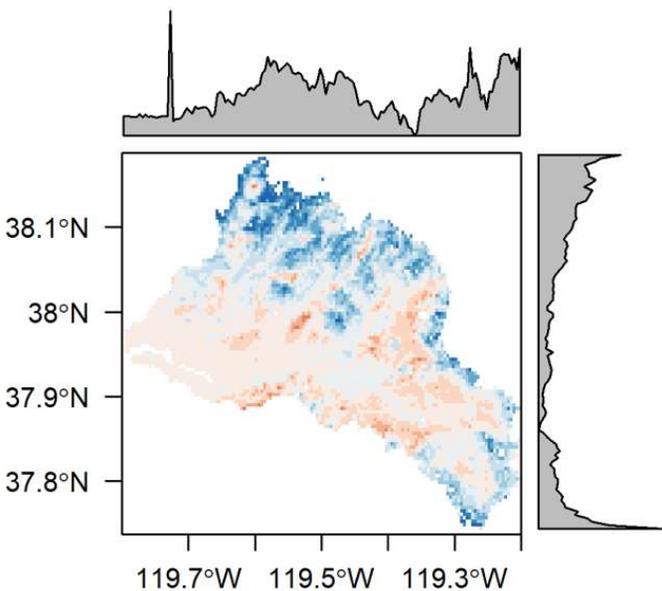
### 4) Schneider's near real-time regression model (Schneider & Molotch, 2016)

- a) Snow observations + generalized linear model + cross validation
- b) cloud-free day, 500m, entire Sierra, highly depend on snow observations

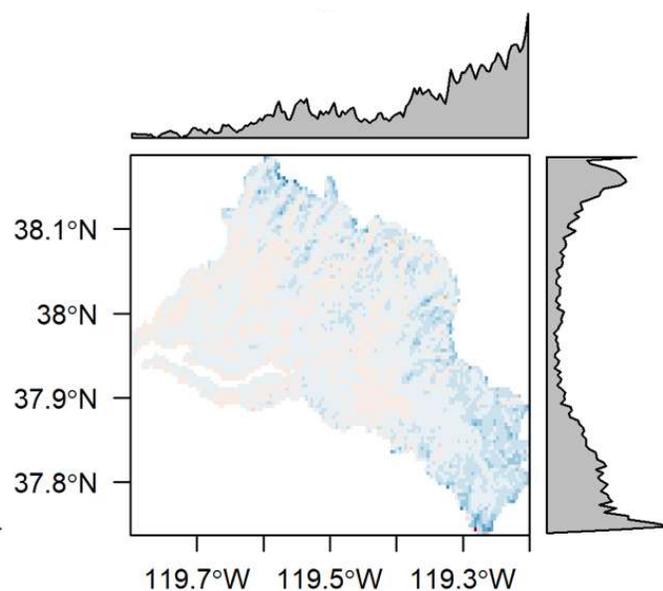
# How do available SWE products compare to ASO SWE on average?



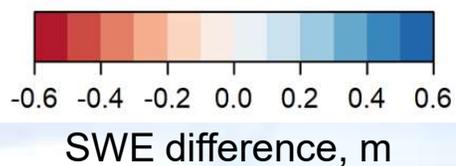
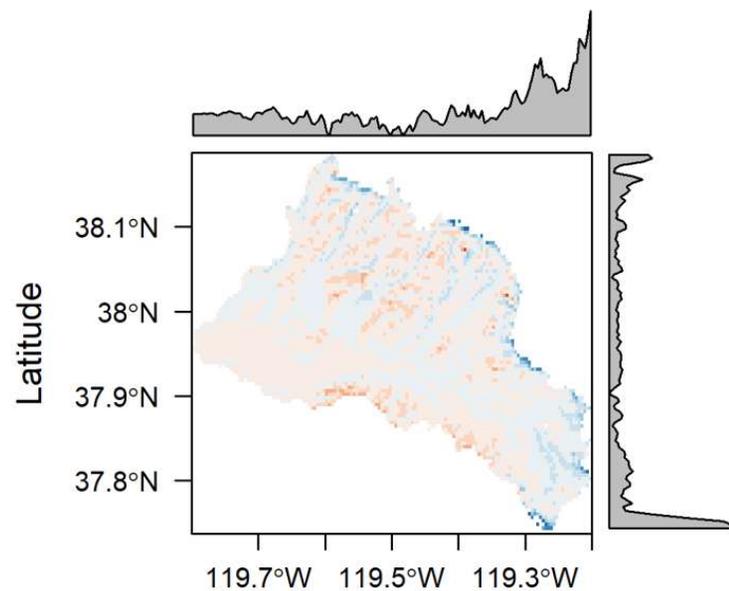
## Guan minus ASO



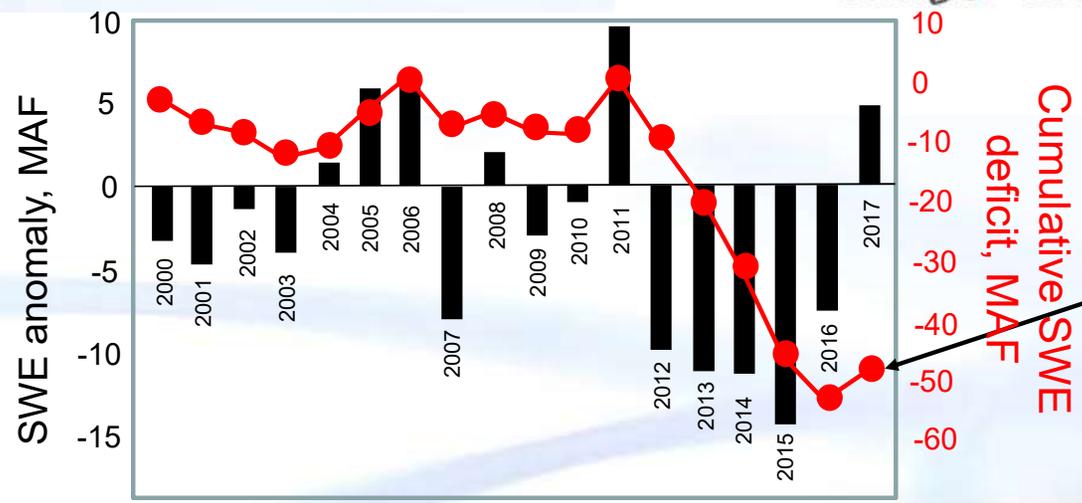
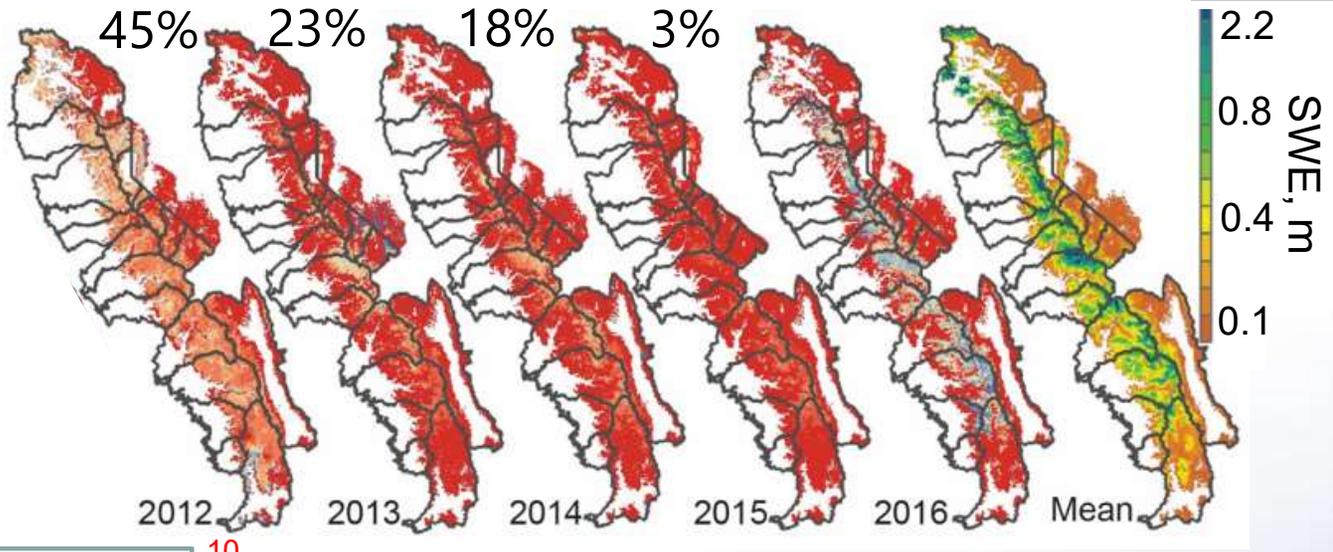
## Margulis minus ASO



## Schneider minus ASO



# Recent snow-water deficits in the Sierra Nevada resolved with the CU/JPL regression SWE product



Deficit going into 2018 water year:  
54 Million Acre Feet

Note: 2018 was also a very low snow year.